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Lupan, O, Ababii, N, Santos-Carballal, D orcid.org/0000-0002-3199-9588 et al. (11 more authors) (2021) Tailoring the selectivity of ultralow-power heterojunction gas sensors by noble metal nanoparticle functionalization. Nano Energy, 88. 106241. ISSN 2211-2855

https://doi.org/10.1016/j.nanoen.2021.106241

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Supporting Information

Tailoring the selectivity of ultralow-power heterojunction gas sensors by noble metal nanoparticle functionalization

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Keywords: Nanolayered materials, heterojunctions, semiconductor oxides, gas sensing, low-energy, ultralow power



Figure S1. Scanning electron microscopy (SEM) images of the: (a) CuO/Cu₂O; (b) TiO₂/CuO/Cu₂O; and (c) AgPt/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 20 nm.



Figure S2. Scanning electron microscopy (SEM) images of $TiO_2/CuO/Cu_2O$ samples covered with Pd nanoclusters at: (a) low and (b) high magnification; Ag nanoclusters at (c) low and (d) high magnification; and AgPt nanoclusters at (a) low and (b) high magnification.



Figure S3. (a) Low and (b) high magnification of scanning electron microscopy (SEM) images of interconnected nano-crystallite $TiO_2/CuO/Cu_2O$ set sample with a CuO/Cu₂O thickness of 20 nm covered with AgPt nanoclusters of 5-15 nm in diameter. Inset in (b) shows an area of about 160 × 200 nm of sample from (b).



Figure S4. X-ray photoelectron spectroscopy (XPS) spectra of the TiO₂/CuO/Cu₂O heterostructures with CuO/Cu₂O thickness of 20 nm (Cu20), decorated with Pd nanoparticles (red line) and reference layer (black line).



Figure S5. (a) Transmission spectra; and (b) Plot of absorption near the UV edge vs. wavelength of the Pd/TiO₂/CuO/Cu₂O heterostructure set sample with CuO/Cu₂O thickness of 20 nm annealed at 420 °C for 0.5 h.



Figure S6. Plot of $(\alpha hv)^2$ vs. hv for the copper oxide semiconductors in the substrate of Pd/TiO₂/CuO/Cu₂O.



Figure S7. (a) Response / recovery times to 100 ppm of hydrogen at different operating temperatures of the $TiO_2/CuO/Cu_2O$ samples with a CuO/Cu₂O thickness of 20 nm (Cu20) and decorated using Pd-NPs; (b) Dynamic response to different gases and volatiles (hydrogen, *n*-butanol, 2-propanol, ethanol, acetone, ammonia and CH₄) of the Pd-NPs/TiO₂/CuO/Cu₂O Cu20-samples at the operating temperature of 250 °C.



Figure S8. Dynamic response to: (a) 5 ppm; and (b) 50 ppm of hydrogen gas of the Pd-NPs/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 20 nm (Cu20) at the operating temperature of 250 $^{\circ}$ C.



Figure S9. (a) Response to different gases and volatiles (hydrogen, *n*-butanol, ethanol, 2propanol, acetone and ammonia) of the Pd/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 30 nm (Cu30); (b) The *I-V* current-voltage characteristic of the Pd/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 30 nm (Cu30) at the temperature of operation of 250 °C, 300 °C and 350 °C. The inset of the *I-V* currentvoltage shows the behaviour of the same samples at low temperature of operation; (c) Dynamic response to hydrogen of the Pd/TiO₂/CuO/Cu₂O Cu30 samples at various temperatures of operation; (d) Dynamic response of the Pd-functionalized TiO₂/CuO/Cu₂O Cu30 samples to three consecutive pulses of hydrogen at the operating temperatures of 300 °C.



Figure S10. Dynamic response to: (a) 5 ppm; (b) 50 ppm; and (c) 100 ppm of *n*-butanol of the Ag-NPs/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 60 nm (Cu60) at the temperature of operation of 300 °C.



Figure S11. Dynamic response to: (a) 5 ppm; (b) 50 ppm; and (c) 100 ppm of *n*-butanol of the AgPt-NPs/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 60 nm (Cu60) at the operating temperature of 300 °C.



Figure S12. Response to different gases (hydrogen, *n*-butanol, 2-propanol, ethanol, acetone and ammonia) versus applied voltage of the Pd/TiO₂/CuO/Cu₂O samples with a CuO/Cu₂O thickness of 20 nm (Cu20).



Figure S13. Dependence of the power consumption versus applied voltage for the $TiO_2/CuO/Cu_2O$ samples with a CuO/Cu₂O thickness of 20 nm (Cu20) and decorated using Pd, Ag or AgPt NPs.

Supporting Information Text S1

Heterostructures formed by *p-n* semiconductors, especially those functionalized with noble metals, have a highly efficient catalytic activity and can be used to enhance surface reactions in chemical sensing materials [1,2] and other applications [3–6]. Titania is known to be *n*-type semiconductor oxide [2,7,8], but mixed CuO/Cu₂O phases are *p*-type semiconductor oxides [9,10]. Thus, in TiO₂/CuO/Cu₂O heterostructures it would normally appear that the main detection currents must flow through the TiO₂ layer. However, the resistance of the TiO₂/CuO/Cu₂O heterostructures increases, as the detection currents are also influenced by the CuO/Cu₂O layer [2,11], which demonstrates a typical behavior of *p*-type semiconductor oxides [2,11].

Moreover, it is known that the functionalization of oxides (such as ZnO, SnO₂, TiO₂, Cu₂O and Fe₂O₃) with different noble metals and/or their alloys produces significant improvements of their sensing performances [2,11]. For specimens functionalized using nanoparticles (NPs) of noble metals or their oxides, the surface sensing mechanisms mainly follow to pathways [12,13]. The electrical sensitization mechanism takes place due to the formation of Schottky barriers at the nanojunction between the noble metal nanoparticles and the semiconductor oxide surface [14]. The chemical sensitization mechanism as a result of the new catalytic properties provided by the noble metals, which enhance the detection properties of gas sensors [12,15–19]. Thus, chemical sensitization facilitates the adsorption of certain gas molecules on the metal NP surface, which induces better interaction and reaction with pre-absorbed oxygen species, improving the gas detection performance [20,21].

Since we added Pd, Ag or AgPt NPs on the surfaces, more oxygen species are adsorbed via the "spillover effect", as was detected during the XPS studies (see Figure 3a,b and Figure S4). The good selectivity to hydrogen gas of the Pd/TiO₂/CuO/Cu₂O heterostructures can be explained by the fact that Pd is known to be an excellent oxygen and hydrogen dissociation catalyst, even at low temperatures [13,15,22]. From the experimental data (Figure 4b), it can be observed that between relatively low operating temperatures and up to 200 °C, the signal recovery takes place more slowly than at high temperatures, as the adsorbed hydroxyl species (obtained during exposure to H₂) persist longer on the surface of the Pd NPs. The hydroxyl species are removed more slowly in the form of H₂O desorption at low than at high temperatures [23,24]. If the temperature is increased the oxygen spillover is predominant, since it is a thermally activated event [25]. In our case, the chemical sensitization is observed following the dissociation of hydrogen molecules over the reduced Pd NPs, forming atomic H with better reactivity:

$$H_{2(gas)} \xrightarrow{Pd} H_{(ads)} + H_{(ads)} \tag{S1}$$

$$H_{(ads)} + H_{(ads)} \rightarrow 2H_{(ads)}^+ + 2e^-$$
(S2)

indicating that the density of Pd NPs on the material surface is a highly important parameter [25].

As found in the XPS experiments of the PdO-functionalized WO₃-based sensors, the proton species (H^+) generated form palladium hydrides (PdH_x), which have lower work function in comparison to the pure Pd metal [26]:

$$xH_{(ads)}^+ + xe^- + Pd_{(s)} \to PdH_{x(s)}$$
(S3)

The formation of PdH_x simplifies the transfer of charge carriers from the nanoparticles to the $TiO_2/CuO/Cu_2O$ heterostructures and decreases the electron-depleted region, thus improving the gas detection value [15].

During the exposure of the Ag/TiO₂/CuO/Cu₂O or AgPt/TiO₂/CuO/Cu₂O heterostructures surfaces to *n*-butanol vapor, it reacts with oxygen species to form CO₂ and H₂O. The enhanced vapors sensing properties can be explained due to the unique properties of the heterostructures, that is the spillover and catalytic effects of the Ag and AgPt NPs [27]. In this process, the electrons are released from the oxygen species, reducing the size of the region with depletion of the electrons and the potential barriers. This process, which increases the resistance, is represented as [28–30]:

$$(C_4H_9OH)_{gas} \leftrightarrow (C_4H_9OH)_{ads}$$
(S4)

$$(C_4H_9OH)_{ads} + 12O_{ads}^{2-} \rightarrow 4CO_2 + 5H_2O + 24e^-$$
 (S5)

$$(C_4H_9OH)_{ads} + 12O_{ads}^- \rightarrow 4CO_2 + 5H_2O + 12e^-$$
 (S6)

These concepts support the superiority of the gas sensing behavior of the $Ag/TiO_2/CuO/Cu_2O$ or $AgPt/TiO_2/CuO/Cu_2O$ heterostructures. Moreover, the large surface area of the crystals and the good catalytic performance of Ag and AgPt ensure a large number of active sites which facilitate the oxidation reaction of the VOC vapors. As a result, the gas can diffuse into the pores of the sensor, which increases the gas response.

Supporting Information Text S2

The ternary TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) heterojunction was modelled using a slab with an area of 125.512 Å² and containing 32 formula units (f.u.) of Cu₂O, 16 f.u. of CuO and 8 f.u. of TiO₂ dispersed over 12 atomic levels, see Figure 8. A vacuum gap of 20 Å was added in the direction perpendicular to the surface to avoid interaction between neighbouring cells.

The initial geometries for the monometallic nanoclusters were chosen based on the most thermodynamically stable structure, reported with the D_{5h} point group for isolated particles containing 7 transition metal atoms [31]. Figure S14a displays this shape consisting of 5 atoms occupying equatorial positions, which form a pentagon, and the remaining two atoms lying in the axial sites above and below the particle plane. We have selected this cluster size, as this is the smallest structure that can contain the Pt composition of approximately 15% closest to the one prepared in the experiments. For Ag₆Pt, we have used the configuration where the Pt is located at one of the axes of the cluster, since the occupation of the equatorial positions makes the system 162 meV higher in energy. Note that replacing one Ag by one Pt in Ag₆Pt reduces the symmetry of this nanoparticle to the $C_{5\nu}$ point group. The Ag₆Pt particle was incorporated into the surface in such a way that the Pt atom was exposed, since we want to understand the chemical sensitisation of this element in the sensors. The transition metal clusters were added at the depression confined within the ring of TiO_2 units exposed at the top thin film in the ternary heterojunction, since they have similar sizes, offering a geometrically suitable anchor site. Following optimisation of the ternary heterostructures decorated with the nanoparticles, we found that the noble metal atoms did not stay in the geometry with

the D_{5h} point group, see Figures 8 and S14. Our simulations suggest that the noble metal occupying the axial position embedded into the ring of TiO₂ units, moving towards the heterostructure and further fixing the nanoparticle to the substrate. Following adsorption, the largest (least) elongation of the atoms lying at the opposite axial positions is calculated at 1.76 (1.18) Å for the Ag₇ (Pd₇) cluster. Replacing the exposed atom with Pt, equivalent to a concentration of 14.28% for this element, reduces the stretching of the axial atoms by 13.6% with respect to the parent nanoparticle. The adsorption of the clusters also caused distortions to the pentagons, *i.e.* 80% of the equatorial atoms moved 0.10 Å towards the axis of the Pd₇ cluster, while one of the Ag atoms moved 2.36 Å towards the vacuum, sitting at the same height of the axial atom in Ag₇. The pentagon of Ag₆Pt was the least affected and remained approximately flat after its incorporation into the surface of the heterojunction.



Figure S14. Equatorial view (top panels) and axial view (bottom panels) of: (a) an isolated nanoparticle containing 7 atoms in the D_{5h} point group, as well as (b) Pd₇; (c) Ag₇; and (d) Ag₆Pt clusters in their optimised adsorption configuration, where the heterostructure has been omitted for clarity. Pd, Pt as well as Pt atoms are in different shades of grey.

The Tersoff and Hamann scheme has been employed previously to realistically mimic experimental scanning tunnelling microscopy (STM) images [32-35], given that the tunnelling current is corresponding to the local density of states of the surface at the position of the tip. We have explored a range of positive and negative sample bias (V) and found that the addition of the noble metal nanoparticles modifies the valence bands around the Fermi level $(E_{\rm F})$. For example, the incorporation of the Ag₇ cluster to the ternary heterojunction broadens by 0.5 eV the occupied electronic states of the material around the Fermi level. Swapping 14.3% of the Ag by Pt atoms further widens the valence bands of the sensor, requiring a sample bias of V = -1.5 eV. However, the Pd₇ cluster has a negligible effect on the density of states (DOS) of the hetero-epitaxial device, since a sample bias of V = -0.5 eV is needed both before and after surface functionalisation to force the flow of electrons from the valence band to the probe tip. Despite their different relaxed structures, our STM images suggest that all the noble metal clusters remain within the boundaries of a single dodecagon enclosed by TiO_2 units. The microscopy images also confirm that the deposition of the metal nanoparticles is feasible, if they at least fill 25% of the hollows enclosed by the exposed TiO₂ rings. The simulated STM images are not only in excellent agreement with the discussion of the adsorption structures of the nanoparticles, but they provide further insight into their different shapes, as a tool for differentiation.

We have used equation S7 to calculate the interfacial free energy (σ_{part}) of the nanoparticle functionalised hetero-epitaxial systems,

$$\sigma_{\text{part}} = \gamma_{\text{r}} + \left(E_{\text{int}} - \sum_{o=1}^{2} n_{\text{over}} E_{\text{over}} - E_{\text{sub}} - \sum_{p=1}^{2} n_{\text{part}} E_{\text{part}}\right) / A .$$
(S7)

where γ_r is the relaxed surface energy of the Cu₂O(111) substrate; E_{int} and E_{sub} are the energies of the ternary interface and substrate, respectively; E_{over} is the energy of 1 f.u. in the bulk of the CuO($\overline{1}11$) and TiO₂(111) overlayers; and n_{over} is the number of f.u. in the overlayer; n_{part} represents the number of Ag, Pt and Pd atoms; E_{part} is the energy of one of such transition metal atoms in the *fcc* bulk; *o* represents the two overlayer phases; *p* is the maximum number of atom types in the nanoparticle and *A* is the surface area of one side of the slab.

Supporting Information Text S3

Table S1 reveals that the calculated interfacial free energy increases from the value of 112 meV·Å⁻² for TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) [9,36] after deposition of the transition metal particles. The chemical composition of the cluster plays a key role in the thermodynamic stability, since the most stable hetero-epitaxial junction in this study containing Ag₇ is 145 meV·Å⁻² more stable than the least stable material decorated using Pd₇. Unsurprisingly, the deposition of the Ag₆Pt nanoalloy is slightly less favourable than the functionalisation using the pure Ag₇ parent cluster, since the interfacial free energy is only larger by 29 meV·Å⁻². The adsorption energy of the particles onto the ternary heterostructure was obtained from $E_{ads} = E_{int+part} - E_{int} - \sum_{p=1}^{2} n_{part}E_{part}$, which follows the same trend discussed for the interfacial free energy, as shown in Table S1. The positive value for the adsorption energy indicates that the cohesive forces are important to promote the growth of the transition metal clusters, rather than their disintegration wetting the surface of the device.

Table S1 also displays the charge transfer values (Δq), integrated using the Bader scheme [37–39], which suggest that all particles, and in particular the Ag-based ones, became positive upon adsorption. For the Ag₆Pt cluster, we found that each Ag atom donated +0.337 e⁻ to the surface and Pt, which gained -0.307 e⁻ in agreement with the relative electronegativities of these elements. The Ag₇ cluster has a negligible magnetic moment (*m*), which was also computed using the Bader methodology [37–39], since each positively charged atom has a full 4*d* shell, as reported in Table S1. However, Ag₆Pt and Pd₇ are magnetic, as the negatively charged Pt has a half-filled 6*s* level and the electronically depleted Pd has the electronic distribution 4*d*⁹ with one unpaired electron.

The work function (Φ) is a property that provides evidence of the surface reactivity, as it quantifies the energy required to shift an electron from the Fermi level (E_F) to the potential of the vacuum (E_{vac}). The work function of the ternary heterojunction suffers a reduction of approximately 37% from its initial large value of $\Phi = 7.454$ eV after decoration using the noble metal nanoparticles, as listed in Table S1. The lower work function values calculated for the heterodevices after surface functionalisation explain their enhanced chemical reactivity, compared to these materials before adding the metal nanoclusters. Our simulated work function values have a small difference of up to 0.14 eV, suggesting that the composition of the nanoparticles can be used to finely tune the application of the materials as chemical sensors.

Table S1. Interfacial free energy (σ_{part}) and work function (Φ) for the ternary heterostructure TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) decorated with the Pd₇, Ag₇ and Ag₆Pt clusters. The adsorption energy (E_{ads}) , charge transfer (Δq) and magnetic moment (m) for the nanoparticles on the heterojunctions is also reported. Positive values of Δq indicate that the metal cluster loses electrons.

Cluster	Pd ₇	Ag ₇	Ag ₆ Pt
$\sigma_{\rm part} ({ m meV}\cdot{ m \AA}^{-2})$	418	273	302
$E_{\rm ads} ({\rm eV})$	4.302	0.779	2.249
$\Delta q \ (e^{-})$	+1.127	+1.695	+1.717
$m~(\mu_{ m B})$	0.418	0.014	0.891
$\Phi\left(\mathrm{eV}\right)$	4.825	4.798	4.681

Supporting Information Text S4

We have simulated the adsorption of a selection of the molecules examined during the gas response experiments, *i.e.* H₂, C₂H₅OH and *n*-C₄H₉OH, with the axial and equatorial positions of the transition metal clusters. Following previous works [35,40,41], we decided to introduce the H₂ molecule and the electron rich O atom from the VOCs at a distance of approximately 1.5 Å above the axial and equatorial adsorption sites of the noble metal particles. Moreover, the H from the OH polar functional group were oriented towards a nearby atom of the nanocluster, in order to maximize the number of interactions. All initial configurations were then allowed to relax to their equilibrium adsorption geometries and energies.

The binding energies for the interaction between the adsorbate molecules and the TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) layered system functionalised with the Pd₇ nanoparticle are summarised in Table S2. Our calculations suggest that the most favourable binding configuration takes place when the H₂ molecule interacts with the equatorial Pd atom, releasing an adsorption energy of $E_{ads} = -1.494$ eV. However, the lowest and largest molecular weight alcohols prefer attaching to the equatorial and axial sites of the Pd₇ nanocluster, respectively. The calculated largest binding strength for *n*-C₄H₉OH (C₂H₅OH) is approximately 0.8 (0.6) eV lower than for H₂. The largest difference in adsorption energies between the equatorial and axial sites of the Pd₇ nanoparticle is 1.154 eV, which was calculated for the H₂ molecule. Furthermore, the alcohols showed the lowest variance of adsorption energies between the two Pd sites, with a value of just 0.017 eV for *n*-C₄H₉OH and only 22 times larger for C₂H₅OH. Despite the different

nature of the adsorbates, we observed an inverse relationship of their molecular weight with the change of adsorption energies between the equatorial and axial Pd positions.

Table S2. Adsorption energies (E_{ads}) and charge transfers (Δq) for H₂, C₂H₅OH and *n*-C₄H₉OH on the ternary heterojunction TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) decorated with the Pd₇, Ag₇ and Ag₆Pt clusters. The adsorption site of the adsorbate on the nanoparticles is also indicated. A negative value of Δq denote that the adsorbate loses electronic charge.

		Pd ₇		Ag ₇		Ag ₆ Pt	
Adsorbate	Site	$E_{\rm ads} ({\rm eV})$	$\Delta q \ (e^{-})$	$E_{ m ads}$ (eV)	Δq (e ⁻)	$E_{\rm ads}({\rm eV})$	$\varDelta q \; (e^{-})$
H_2	axial equatorial	-0.340 - 1.494	-0.046 0.319	- 0.282 0.178	-0.039 -0.053	-0.735 - 0.748	0.011 -0.055
C ₂ H ₅ OH	axial equatorial	-0.515 -0.896	$-0.089 \\ -0.084$	- 0.596 -0.579	$-0.065 \\ -0.057$	-0.395 -0.916	$-0.085 \\ -0.098$
<i>n</i> - C ₄ H ₉ OH	axial equatorial	-0.699 -0.682	-0.094 -0.105	-0.560 - 1.129	-0.074 -0.057	-0.852 - 1.053	-0.121 -0.065

Table S2 also lists the adsorption energies released on $Ag_7/TiO_2(111)/CuO(\overline{1}11)/Cu_2O(111)$, displaying a strong shift in preference towards *n*-C₄H₉OH, where we calculated $E_{ads} = -1.129$ eV on the equatorial site. However, the adsorption of the largest molecular weight alcohol on the least coordinated axial site reduces its binding energy by around 50% compared to its equatorial Ag counterpart. C_2H_5OH releases $E_{ads} = -0.596$ and -0.579 eV when it interacts with the axial and equatorial positions, respectively, suggesting that this alcohol has a minor preference for the former adsorption site. We found that the non-polar H₂ molecule interacts weakly endothermically and exothermically with both the equatorial and axial Ag atoms,

respectively, with a difference in binding energies of *ca*. 0.5 eV. Our calculations reveal that the decreasing order of the molecular adsorption strength is $E_{ads}(n-C_4H_9OH) > E_{ads}(C_2H_5OH) > E_{ads}(H_2)$ after replacing the axial Ag atom by Pt in Ag₇, as shown in Table S2. However, the most favourable molecular interactions take place *via* the Ag sites, suggesting that the axial Pt species acts as a promoter of the equatorial atoms of the Ag₆Pt nanocluster. For the equatorial Ag binding position, we have elucidated the adsorption energy values of $E_{ads} = -1.053$, -0.916 and -0.748 eV for $n-C_4H_9OH$, C_2H_5OH and H_2 , respectively. The smallest difference in adsorption energies between the axial Pt and equatorial Ag positions was found for H₂, which are almost degenerate at 0.013 eV. Inspection of the differences in binding energies between the two adsorption sites and the alcohols exhibits an inverse relationship with their molecular weights.

For the system containing the Pd₇ clusters, H₂ interacts molecularly and nearly vertically at 1.75 Å above the 5-fold axial Pd site (see Figure S15a), where it shows the least favourable adsorption observed on this material. The alcohols prefer to establish a single coordinate bond through their O with the axial Pd atom, but the molecules position themselves in different orientations with respect to the metal site. For example, C_2H_5OH moved outwards during the geometry optimisation from the initial equatorial site, forming a laterally coordinate bond of 2.27 Å to the axial Pd atom in its most stable adsorption configuration, as shown in Figure S15b. Despite the same O–Pd distance calculated for the interaction of C₂H₅OH with the two types of sites, the adsorbate remained atop the axial position of Pd₇ and further away from the sensor. The O atom from the largest molecular weight alcohol stayed above the initial adsorption site, *i.e.* at 2.23 and 2.13 Å from the axial and equatorial Pd sites, see Figure S15c. Our simulations indicate that the short hydrocarbon chain of C_2H_5OH stays parallel to the surface, which, however, repels the longer alkyl radical of C_4H_9OH into a perpendicular configuration.

We have also analysed the atomic charges using the Bader partition scheme, which reveals that the VOCs on both adsorption sites and H₂ on the axial position of Pd₇ that lost electronic density, as shown in Table S2. For these interactions, the calculated charge transfers are below $\Delta q = -0.105 \text{ e}^-$ and their values are proportional to the molecular weight of the adsorbate. We found that the difference in charge transfer was 0.05 and 0.09 e⁻ for the two adsorption sites of *n*-C₄H₉OH and C₂H₅OH, respectively. Interestingly, the largest charge transfer for each VOC molecule was observed for the least favourable adsorption configuration. Unlike the alcohols, which lost charge density, in the most favourable interaction of the H₂ molecule with the equatorial position of Pd₇, we detected instead that the surface donated $\Delta q = 0.319 \text{ e}^-$ to the adsorbate. Our charge transfers suggest that electronic effects play a major role in the selectivity and sensitivity towards H₂ of the ternary heterojunction containing the Pd₇ clusters, which is essential to detect and discriminate this molecule within a mixture of VOCs.

Figure S15d-f illustrates the binding configurations of H₂, C₂H₅OH and *n*-C₄H₉OH on the most favourable adsorption sites of the Ag₇/TiO₂(111)/CuO($\overline{111}$)/Cu₂O(111) system. The H₂ molecule adsorbs molecularly at approximately 2.0 Å above the axial and to the side of the equatorial sites of the Ag₇ nanocluster, see Figure S15d. The sensor can only exert a minor effect on the intramolecular H–H distance, with respect to the isolated H₂ molecule, which was calculated at 0.79 Å on both types of adsorption positions. We found that the C₂H₅OH molecule forms a vertical coordinate bond on the axial site with an O–Ag distance of 2.35 Å, which becomes 0.03 Å shorter at the equatorial adsorption

position, as shown in Figure S15e. The largest molecular weight alcohol interacts perpendicularly with the axial Ag atom at the slightly elongated distance of 2.31 Å. We observed that C_2H_5OH forms a flat adsorption configuration on both sites of the heterojunction decorated using the Ag₇ nanoparticles.

For the molecular adsorptions on the sensor decorated by the Ag₇ nanoparticles, the Bader charge transfers were calculated between -0.039 and -0.074 e⁻, see Table S2. These values indicate that the adsorbate loses electronic density to the heterojunction functionalised with the nanocluster, showing no clear correlation with the binding energies of the VOC and H₂ molecules. For example, the most thermodynamically favourable adsorption mode for $n-C_4H_9OH$ at the equatorial position of the Ag₇ cluster displays an intermediate charge transfer of -0.057 e^- . However, shifting this alcohol to its less stable adsorption site at the axial Ag increases the charge transfer to the largest value observed on this functionalised sensor. The H_2 molecule donates -0.053 e⁻ when it interacts endothermically with the equatorial Ag atom, while the charge transfer is reduced to -0.039 e^- on the axial adsorption site of the nanoparticle. Unlike *n*-C₄H₉OH and H₂, which experienced the largest charge flows in their least stable adsorption sites, C_2H_5OH preferred to donate $-0.08 e^-$ more at the axial than at the equatorial adsorption site, in line with their different binding energies. The lack of agreement of the charge transfers with the molecular interaction strengths make are unable to explain the selectivity of the heterosensor decorated with the Ag₇ cluster for *n*-C₄H₉OH. Nevertheless, the small values of electron density flow that we have calculated for this material support the low sensitivity that it displayed in our experiments.



Figure S15. Adsorption of (a, c and g) H₂; (b, e and h) C₂H₅OH; and (c, f and i) *n*-C₄H₉OH on the heterostructure TiO₂(111)/CuO($\overline{1}11$)/Cu₂O(111) decorated with the (top panels) Pd₇, (middle panels) Ag₇ and (bottom panels) Ag₆Pt clusters. Interatomic distances are shown and crystallographic directions are indicated with respect to the Cu₂O(111) substrate. The ternary heterojunctions functionalised using the noble metal nanoparticles are displayed using the space-filling representation, whereas the adsorbates are shown using the stick representation. O atoms are in red, H atoms are in white, C atoms are in brown, Cu atoms are in dark blue, Ti atoms are in light blue and Pd atoms are in grey.

Figure S15g-i depicts the structures of the molecular interactions with the surface sites of the hetero-epitaxial material decorated with Ag₆Pt that released the largest adsorption energies. We found that H₂ remained perpendicularly atop the axial Pt atom at 1.91 Å, while it coordinated laterally to the equatorial Ag site at the more elongated distance of 2.07 Å, which moved outwards upon adsorption, see Figure S15g. Our DFT modelling suggests that C₂H₅OH prefers to stay parallel to the surface, binding both adsorption sites at the same distance of 2.29 Å, regardless of the different chemical nature of the metal atom, as shown in Figure S15h. Moving this alcohol to the axial site forces a reduction of the interfacial O–Pt distance to 2.23 Å, which is nevertheless insufficient to counteract the loss of the hydrogen-bond formed at the equatorial Ag site.

Our calculated charge transfers indicate that most of the adsorbates donate electronic density to the sensor containing the Ag₆Pt nanoclusters, see Table S2. The electronic charges transferred by C_2H_5OH to the axial and equatorial sites of the nanoparticle are -0.085 and -0.098 e⁻, respectively, displaying a direct correlation with the adsorption energies released in these positions. In contrast, *n*-C₄H₉OH donated -0.065 e⁻ in the most stable adsorption configuration on Ag₆Pt, a value that nearly doubled at the axial Pt position, leading to the largest charge transfer on this system. Despite H₂ having very close binding energies on both adsorption sites of Ag₆Pt, our models suggest that those interactions have opposite flows of electronic density, with the molecule receiving a charge of 0.011 e⁻ in the axial position.

In this work, we have simulated the adsorption energies for the VOCs and H_2 and found them to follow the same trends of our gas response experiments for the heterodevices

functionalised with nanoparticles. The positive charge for the noble metal clusters was calculated within the +1.1 to +1.7 e⁻ range, which lies between the values obtained for the cations of the pristine binary and ternary heterojunctions. Our simulations suggest that C_2H_5OH lies parallel to the surface of the sensor, due to its short alkyl radical, only allowing coordination between the molecular O atom and the noble metal. This results in the weakest interactions calculated for the two alcohols investigated computationally here, which compares well with our gas sensing experiments. However, the average distance between the equatorial atom of the nanoparticle and the closest surface O atom from the TiO₂ is 4.22 Å. Thus, we observed the formation of an additional hydrogenbond between the Ag-based nanoparticles and *n*-C₄H₉OH, since its large alkyl radical accommodates itself perpendicularly to the surface, leading to the largest adsorption energies calculated on these systems. We have also shown that there is a concomitant effect between the reduction of the positive charge and the work function for the exposed atoms in the heterojunctions after functionalisation using the metallic nanoparticles. The intermediate atomic charge of the metallic nanoparticles induces a reduction of the work functions with respect to the binary and ternary heterojunctions. The work function descriptor justifies the large sensitivity of the $Pd_7/TiO_2(111)/CuO(\overline{1}11)/Cu_2O(111)$ sensor towards H₂, since it received $\Delta q = -0.319 \text{ e}^-$ from the surface, which allowed its dissociation, releasing the largest exothermic adsorption energy of this study, in excellent agreement with our gas sensing experiments. The quantum mechanical calculations presented here support, complement and explain the changes of selectivity and sensitivity found in our experiments for the ternary $TiO_2(111)/CuO(\bar{1}11)/Cu_2O(111)$ heteroepitaxial junction after decoration using the Pd₇, Ag₇ and Ag₆Pt nanoparticles.

We have performed DFT+U-D3(BJ) simulations to interrogate the properties of the $TiO_2(111)/CuO(\overline{1}11)/Cu_2O(111)$ heterostructure decorated with the Pd₇, Ag₇ and Ag₆Pt nanoparticles as well as their interaction with H₂, C₂H₅OH and *n*-C₄H₉OH. We have explained the incorporation of pentagonal nanoparticles in their ground state symmetry, *i.e.* D_{5h} point group for the monometallic systems and the reduced C_{5v} point group for the Ag₆Pt nanoalloy, onto the depressions existing in the $TiO_2(111)$ layer. We have found positive values for the adsorption energies, indicating that cohesive forces drive the growth of the mono- and bi-metallic nanoparticles. The surface free energy of the heteroepitaxial material rises as a result of the deposition of the nanoparticles, suggesting that the decoration process reduces the stability of the sensor. However, the adsorption of the nanoparticles leads to lower values of the work function, which explains the enhanced sensing properties of the material, in agreement with experiments. The most favourable interaction was calculated for dissociative adsorption of H₂ on the sensor containing the Pd₇ nanoparticles, since the molecule receives charge from the sensor. The large alkyl radical of the *n*-C₄H₉OH molecule positions itself perpendicular to the surface, allowing the formation of additional hydrogen-bond interactions with the surface oxygen when the surface of the heterodevice is decorated using the Ag-based nanoparticles. The small C₂H₅OH molecule always adsorbs parallel, which prevents the formation of a secondary coordination bonds to the surface.

Figure S16 displays the atomic projections of the spin decomposed electronic density of states (PDOS) for the topmost TiO_2 layer of the pristine and noble metal nanocluster modified ternary heterojunctions. Before addition of any nanoparticle, the valence band of the TiO_2 layer is dominated by the 2p levels of the O atoms between the Fermi level

and -4.5 eV, see Figure S16a. The 3*d* states of the Ti atoms appear in the conduction band with the minimum located at 2.9 eV. We also found a small unoccupied band in the minority channel of the spins due to the O *p* orbitals at around 1.5 eV. Our calculated electronic structures suggest that the impregnation of the nanoparticles enhances the PDOS of the occupied Ti 3*d* states with the center roughly located at -2.5 eV as shown in Figure S16b to S16d. The functionalization of the heterojunction with any of the three metal nanoclusters also lowers significantly the occupied bands of the 2*p* states of the O atoms.



Figure S16. Atomic projections of the spin decomposed electronic density of states (PDOS) for the topmost TiO₂ layer of: (a) the pristine ternary heterojunction and after deposition of the (b) Pd₇; (c) Ag₇; and (d) Ag₆Pt nanoclusters. α and β stand for the majority and minority channels of the spins.

The main difference between the PDOS of the functionalized heteroepitaxial junctions lies in the position of the *d* bands of the noble metal atoms. When Pd₇ is decorating the surface, the partially occupied Pd 4*d* states appear between -6.0 and 1.0 eV, see Figure S16b. However, when Pd is replaced by Ag, the 4*d* bands of the noble metal are pushed to lower values of energy, with the maximum now located at -1.7 eV as shown in Figure S16c. Swapping one of the Ag atoms by Pt in Ag₇ do not change significantly the PDOS of the former, but a new narrow band appear at -1.0 eV due to the 5*d* states of the latter, see Figure S16d.

Figure S17 shows the gas response of a Pd functionalized sensor at relative humidity (RH) of 17% and 67%. We can see that the signals are in good agreement, showing that moisture from the air is not detrimental to the functionality of the sensor system.



Figure S17. Dynamic response to 10 ppm of hydrogen in air of the Pd/TiO₂/CuO/Cu₂O samples at different relative humidity (RH) values.

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